

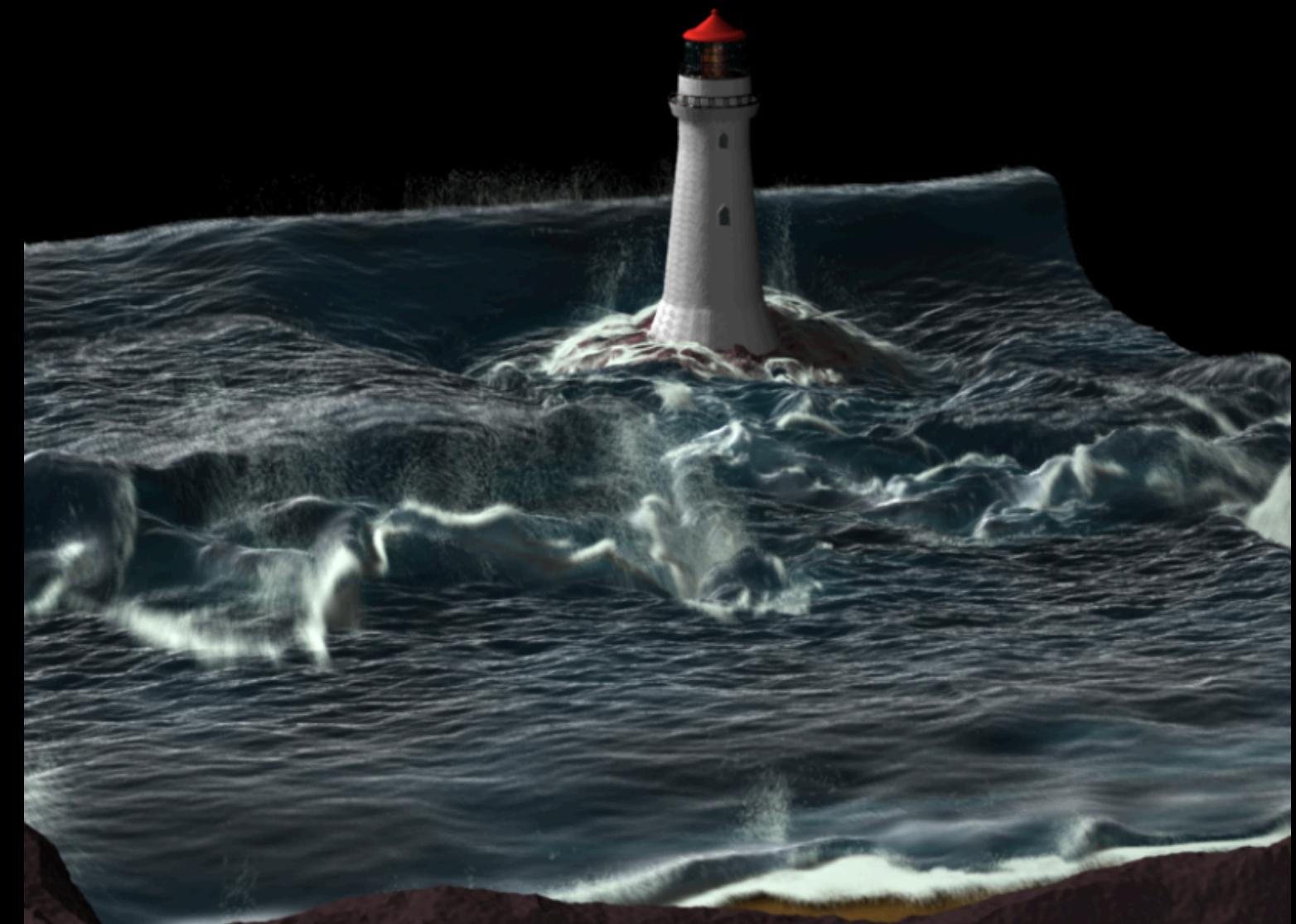
# Position Based Fluids

Miles Macklin      Matthias Müller



# Motivation

- Want great particle based fluid simulation for games
- Must be fast and stable
- Accuracy not so important



[Losasso et al. 2007]

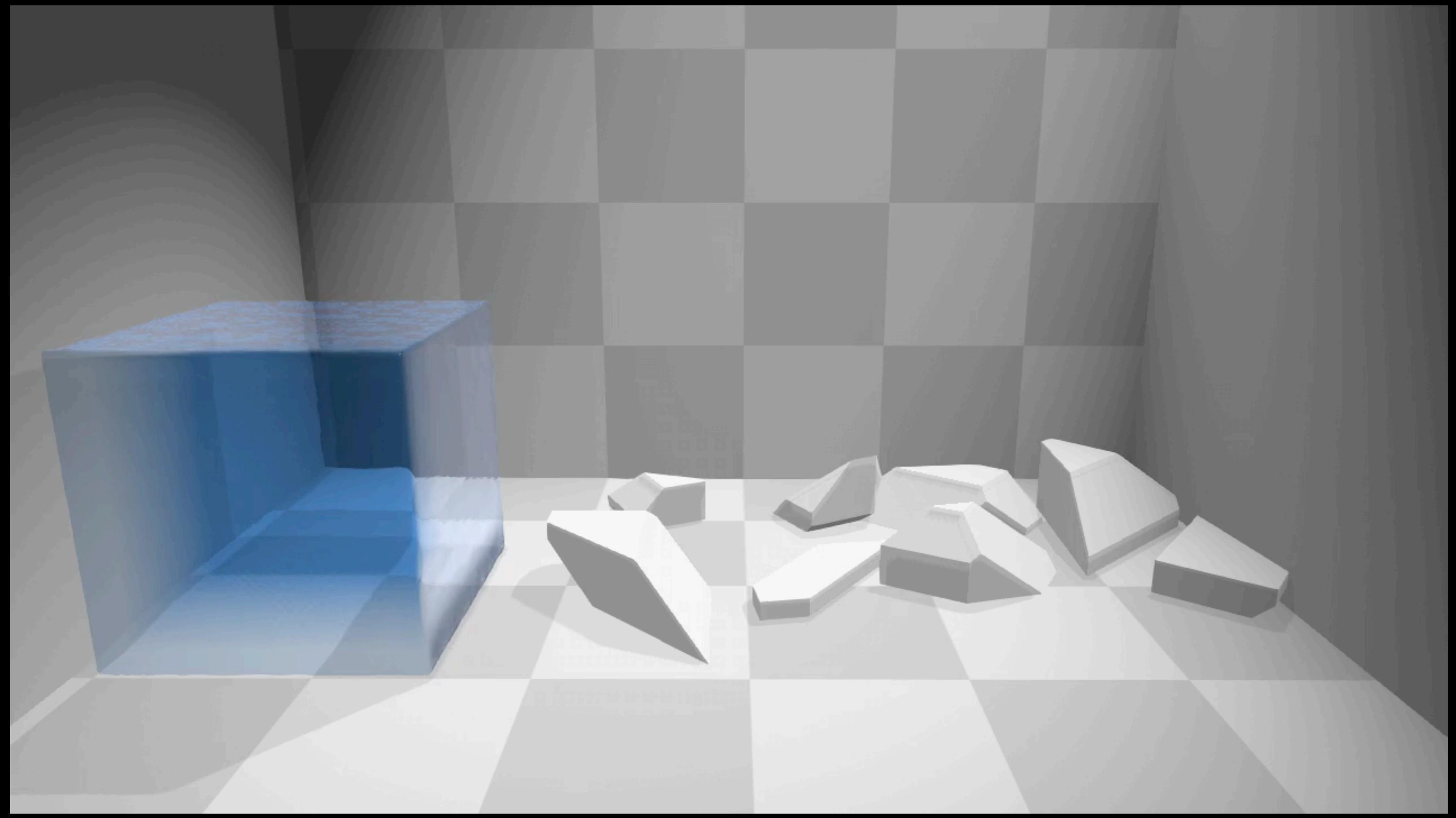
# Traditional Particle Fluids

- Smoothed Particle Hydrodynamics (SPH)
- Difficult to tune stiffness (incompressibility)
- Require small time steps (< 0.0016s common)
- Require large smoothing radius

# Our Approach

- Combines SPH with Position Based Dynamics
- Allows larger time-steps
- Smaller smoothing radius
- Practical for real-time applications

# Examples

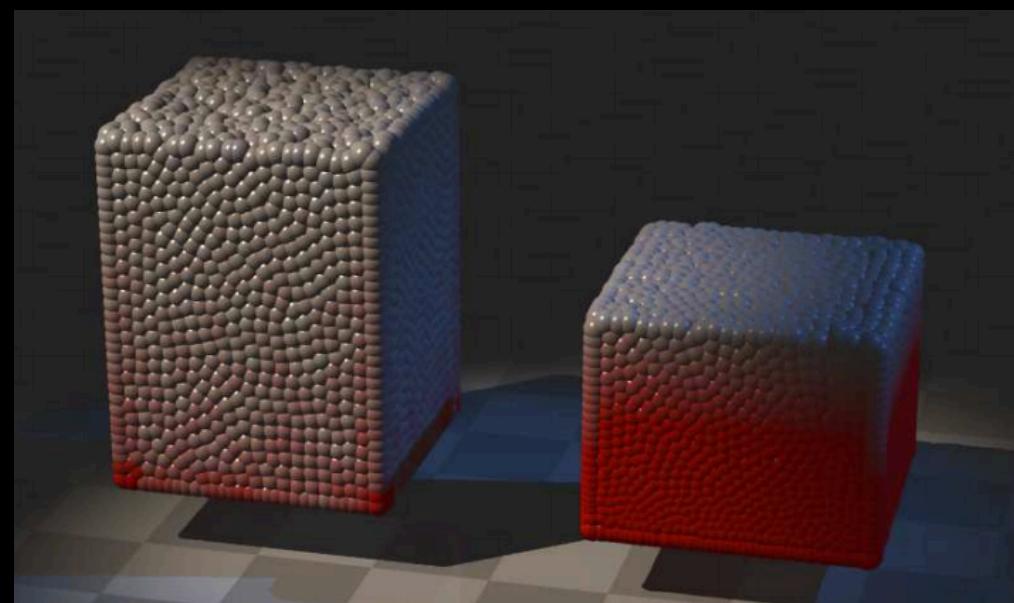




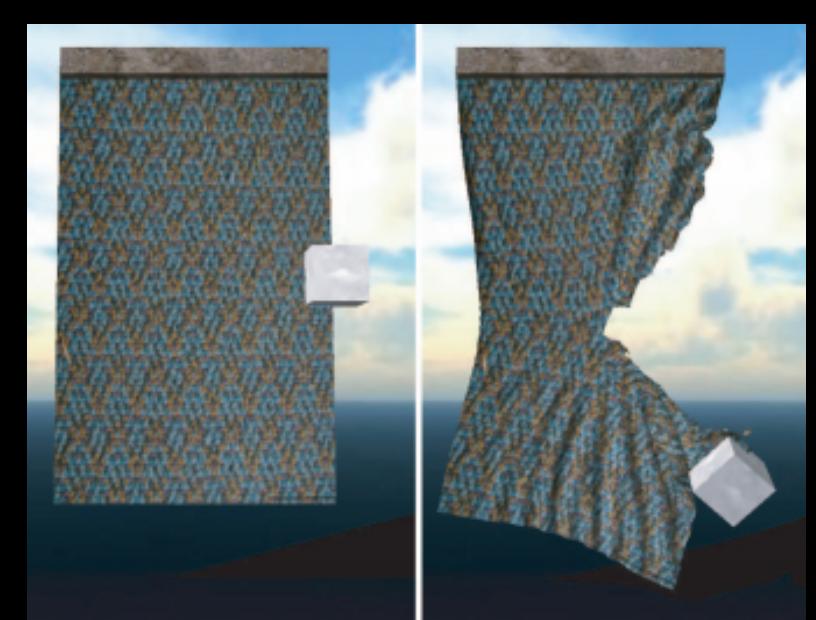
# Related Work



PCISPH  
[Solenthaler &  
Parajola 2009]



Constraint Fluids  
[Bodin et al. 2012]



Position Based Dynamics  
[Müller et al. 2007]

# 3 Ingredients

- Density Constraint
- Artificial Pressure
- Implementation

# Incompressibility

- Most liquids are incompressible
- Want constant fluid density
- Key idea:

*Enforce incompressibility using position constraints*

# Density Constraint

$$C_i(\mathbf{p}_1, \dots, \mathbf{p}_n) = \frac{\rho_i}{\rho_0} - 1 = 0$$

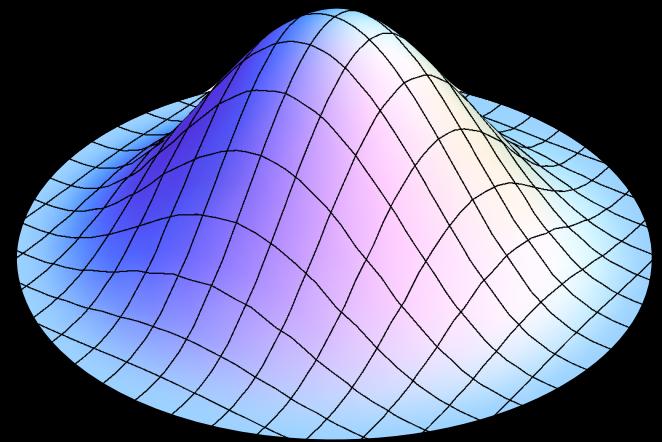
- Positions of particle  $i$  and its neighbors
- Density at particle  $i$
- Rest density ( $1000 \text{kg/m}^3$ )

# SPH Density Estimator

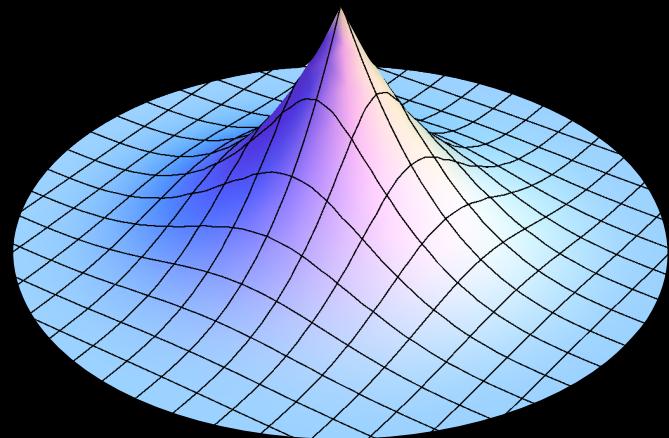
$$\rho_i = \sum_j m_j W(\mathbf{p}_i - \mathbf{p}_j, h)$$

- Density at particle  $i$
- Sum over neighbors of  $i$
- Smoothing kernel, taking position delta and smoothing radius

# SPH Kernel Functions



$$W_{poly6}(\mathbf{r}, h) = \frac{315}{64\pi h^9} (h^2 - |\mathbf{r}|^2)^3$$

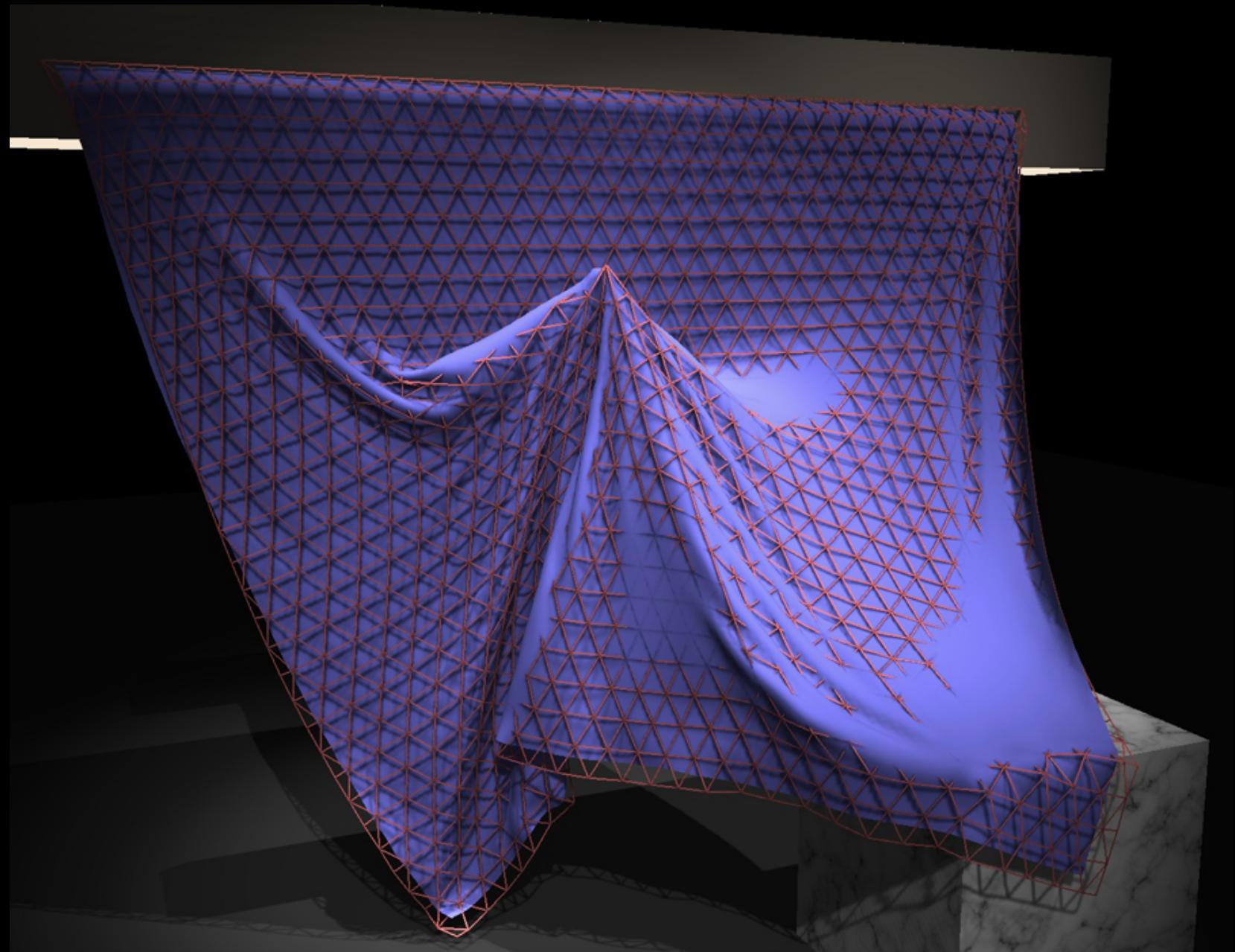


$$\nabla W_{spiky}(\mathbf{r}, h) = \frac{45}{\pi h^6} (h - |\mathbf{r}|)^2 \frac{\mathbf{r}}{|\mathbf{r}|}$$

# How to solve the constraints?

# Position Based Dynamics (PBD)

- Non-linear constraint solver
- Used extensively in games/film
- Unconditionally stable



# Constraint Types

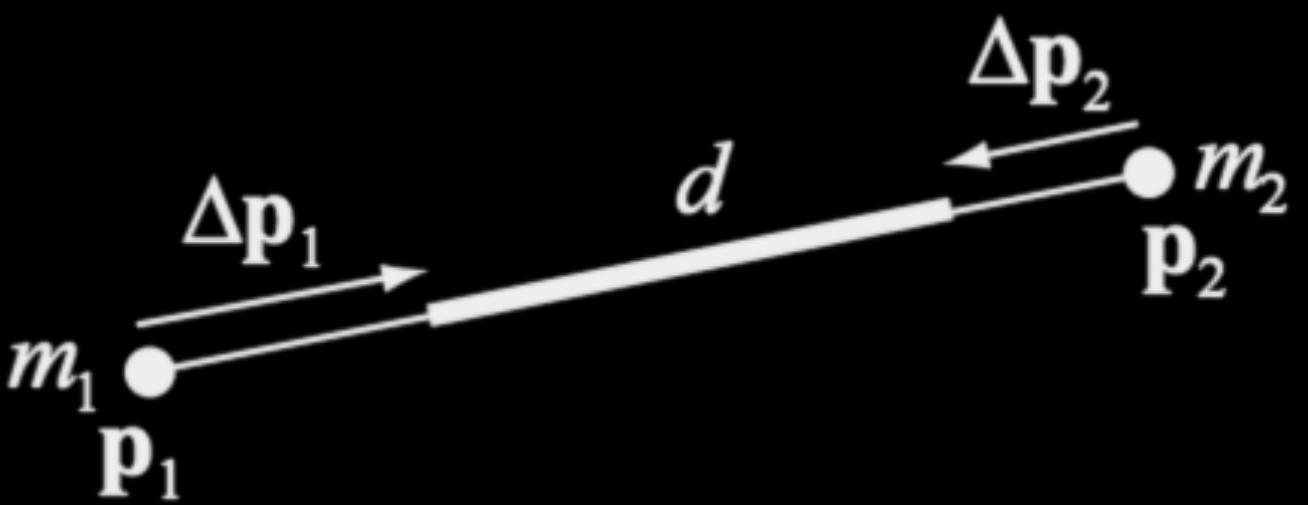
- Distance constraint (mass spring)
- Non-penetration (collision)
- Bending constraint (triangle mesh)
- Density constraint (fluid)



[Bender et al. 2012]

# How PBD solves constraints

- For each constraint
  - Project particles along constraint gradient
- Newton's method applied to each constraint individually
- Iterate until ~converged



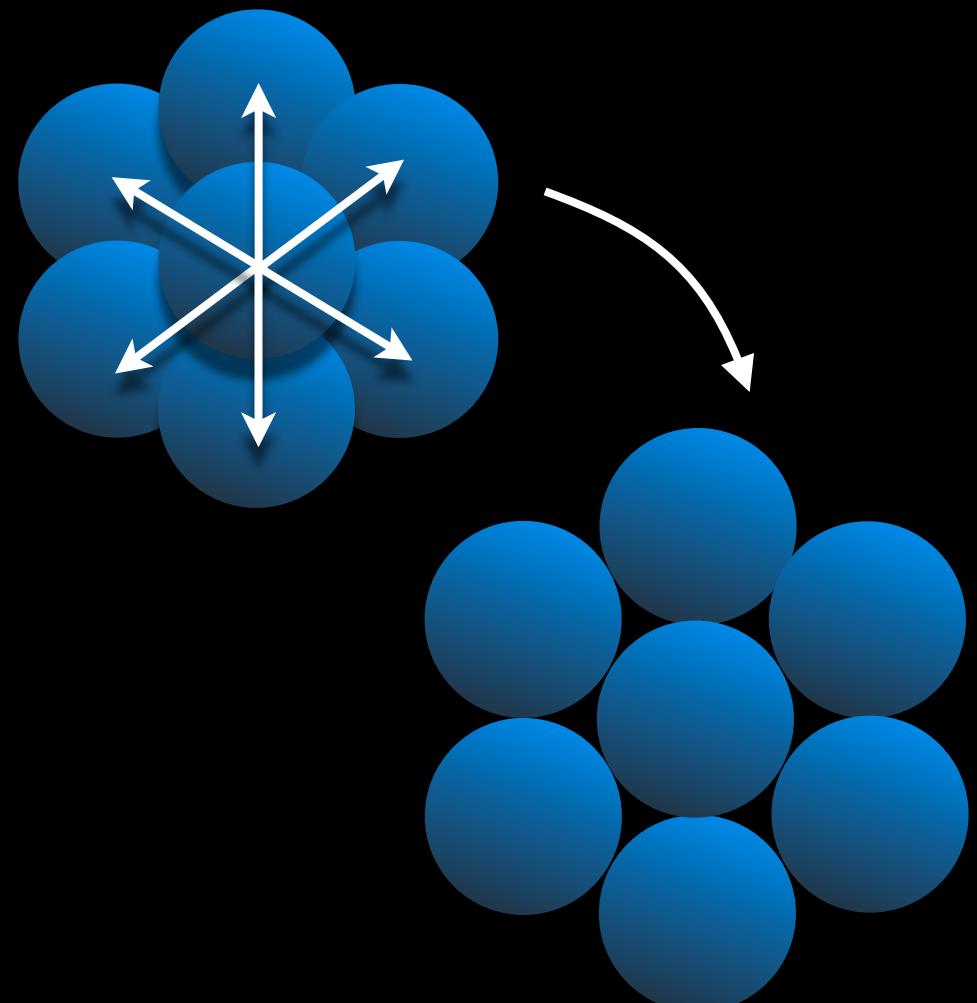
# Solving the Density Constraint

- Position delta:

$$\Delta \mathbf{p}_i = \frac{1}{\rho_0} \sum_j (\lambda_i + \lambda_j) \nabla W(\mathbf{p}_i - \mathbf{p}_j, h)$$

- Constraint force:

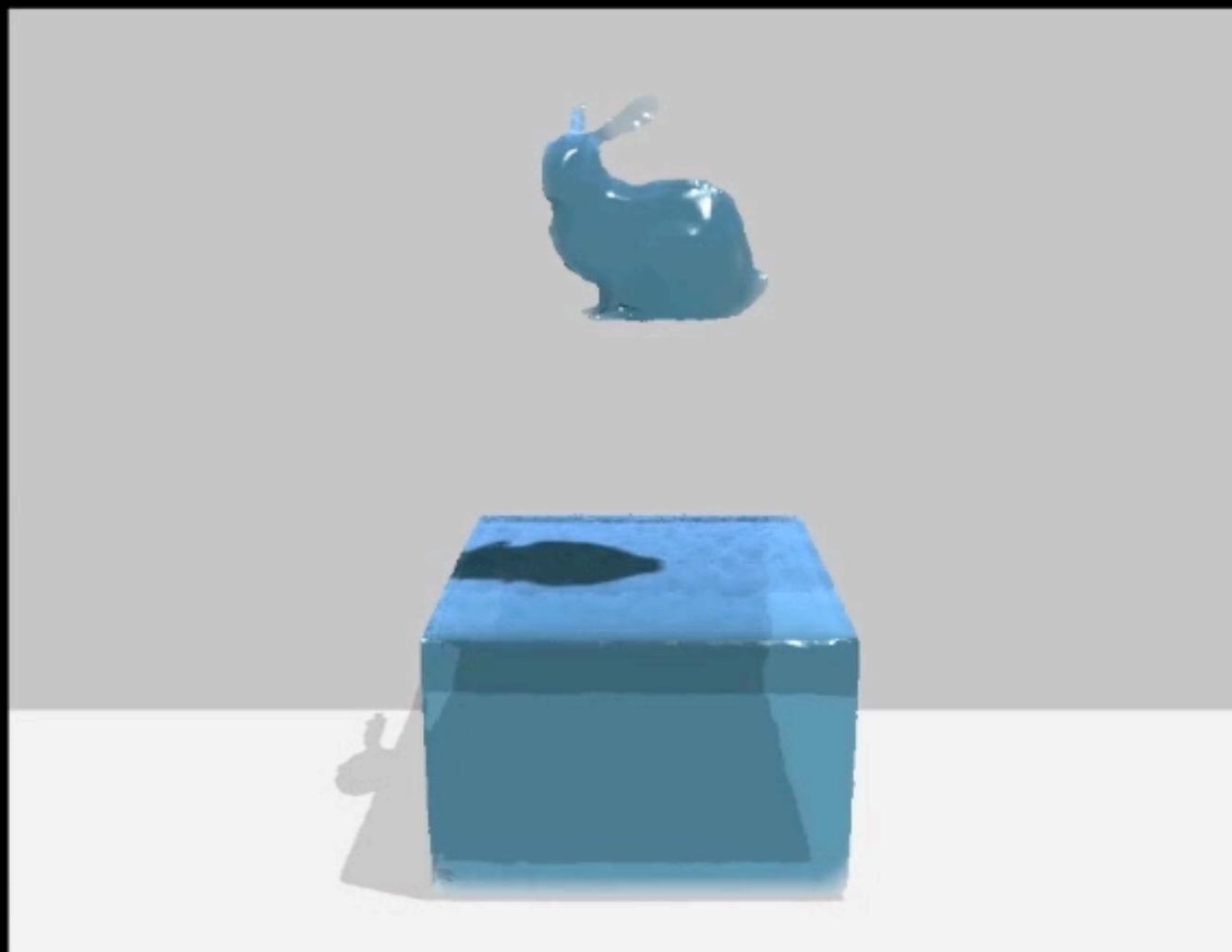
$$\lambda_i = -\frac{C_i(\mathbf{p}_1, \dots, \mathbf{p}_n)}{\sum_k |\nabla_{\mathbf{p}_k} C_i|^2}$$



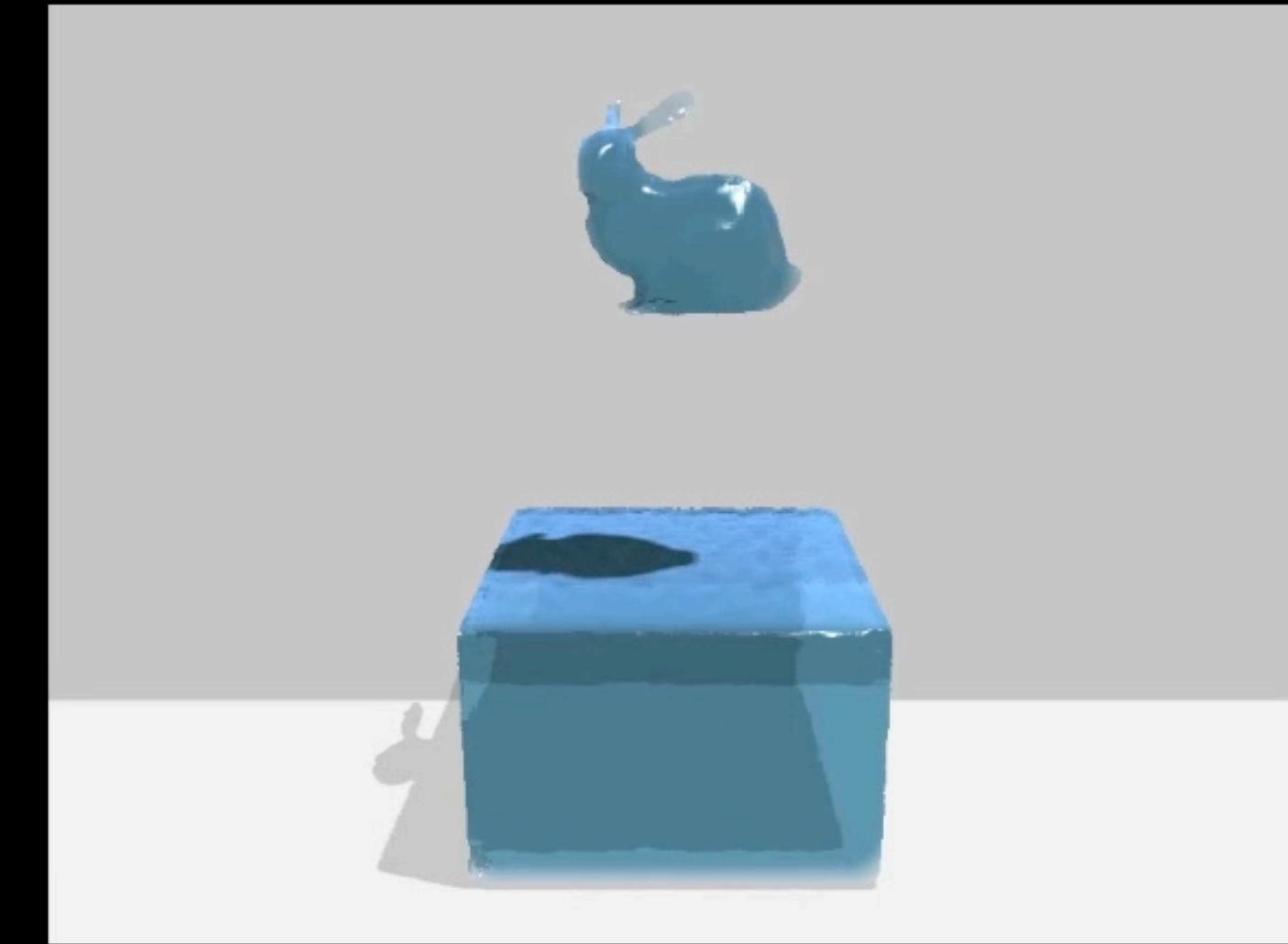
# Advantages

- Unlike PCISPH does not accumulate pressure each iteration
- Avoids problems with isolated/trapped particles
- Allows larger time steps
- Integrates easily with other position based methods

# Comparison with PCISPH

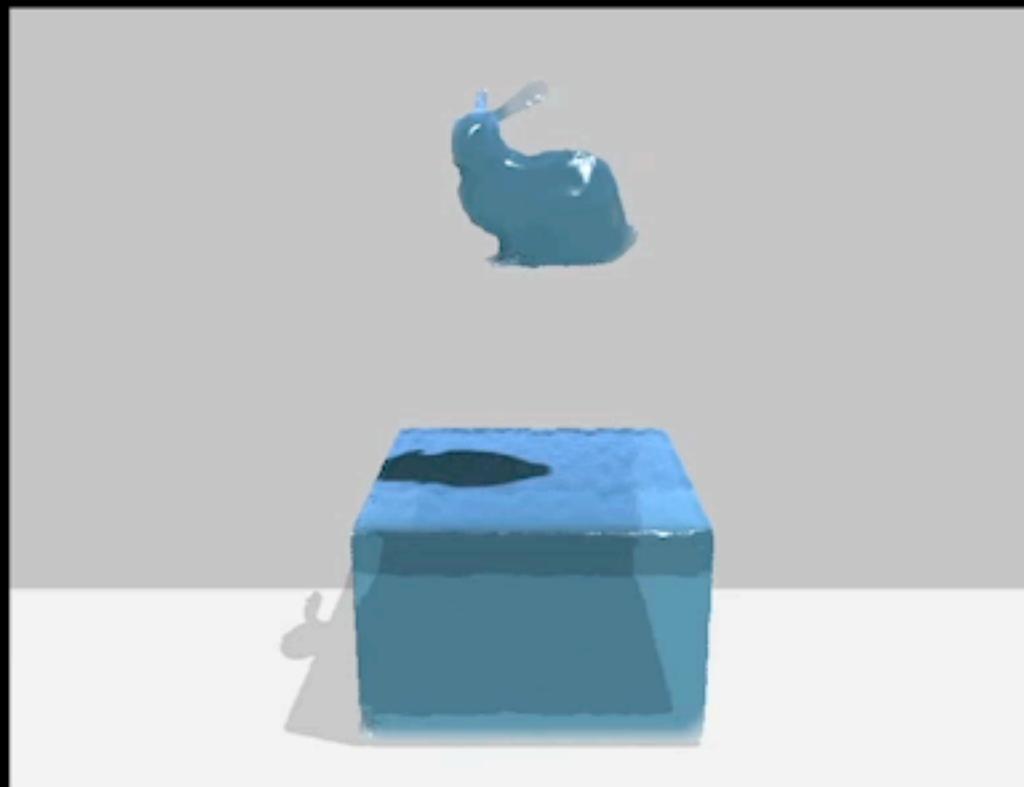


PCISPH  
(10 steps, 4 iterations / frame)

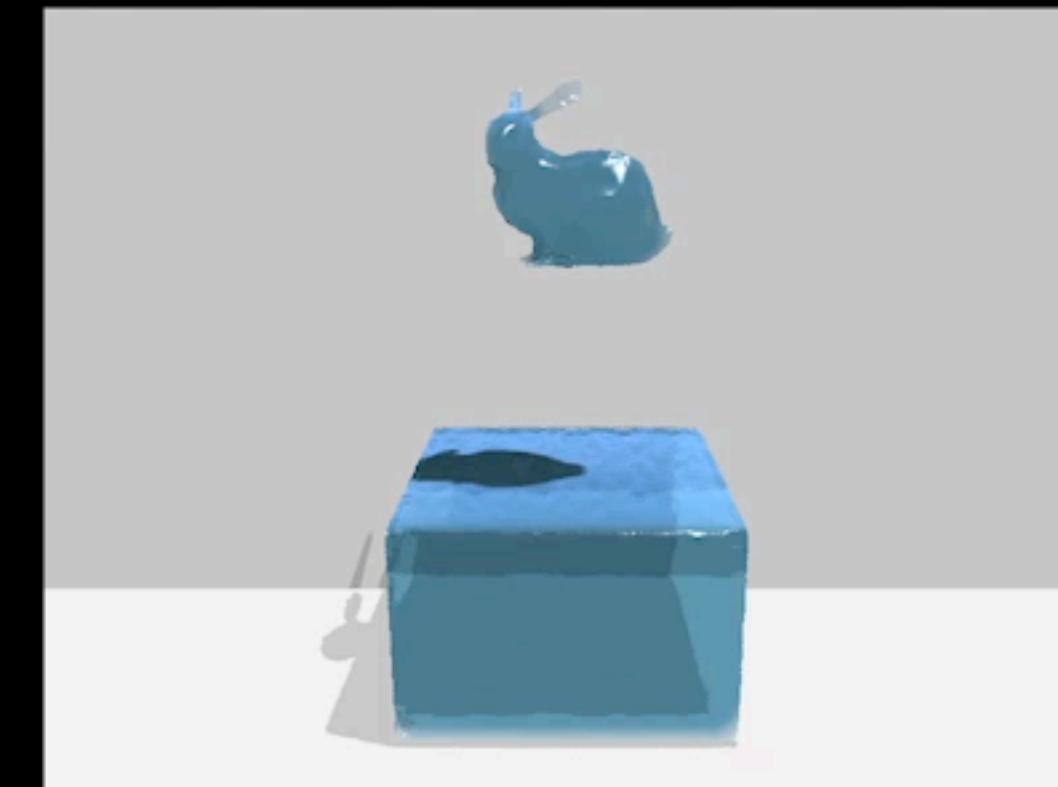


Our Method  
(4 steps, 10 iterations / frame)

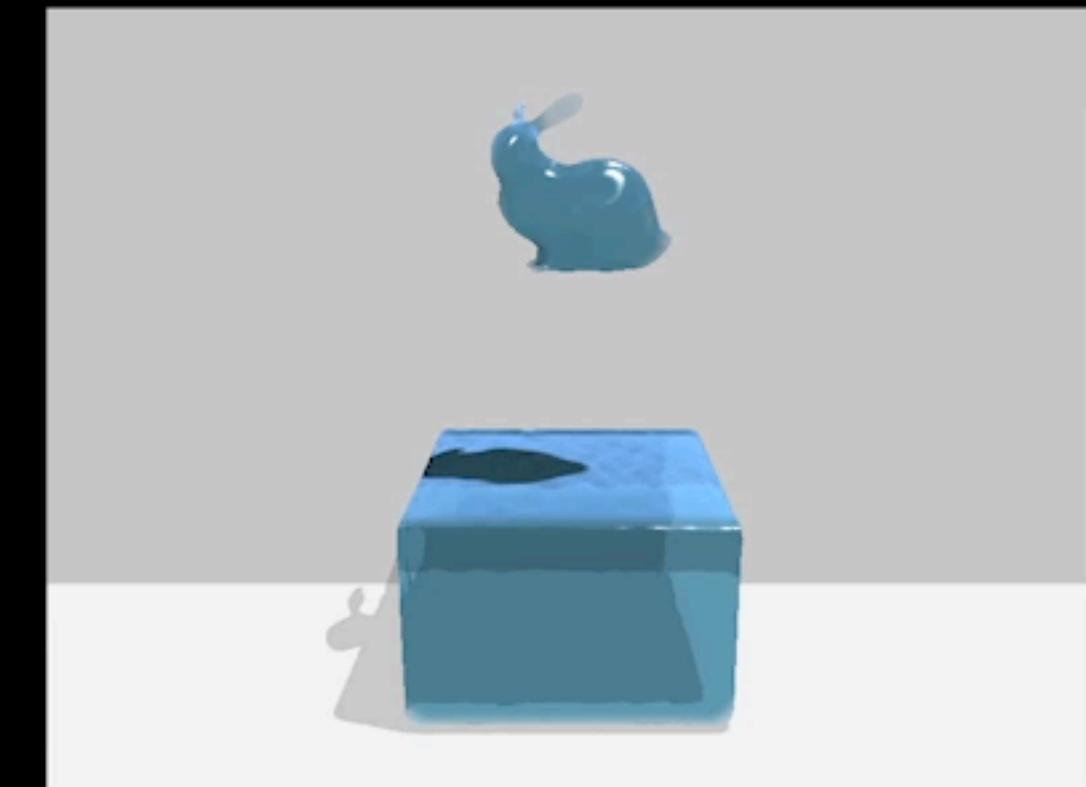
# Graceful Degradation



1 step / 40 iterations



1 step / 10 iterations



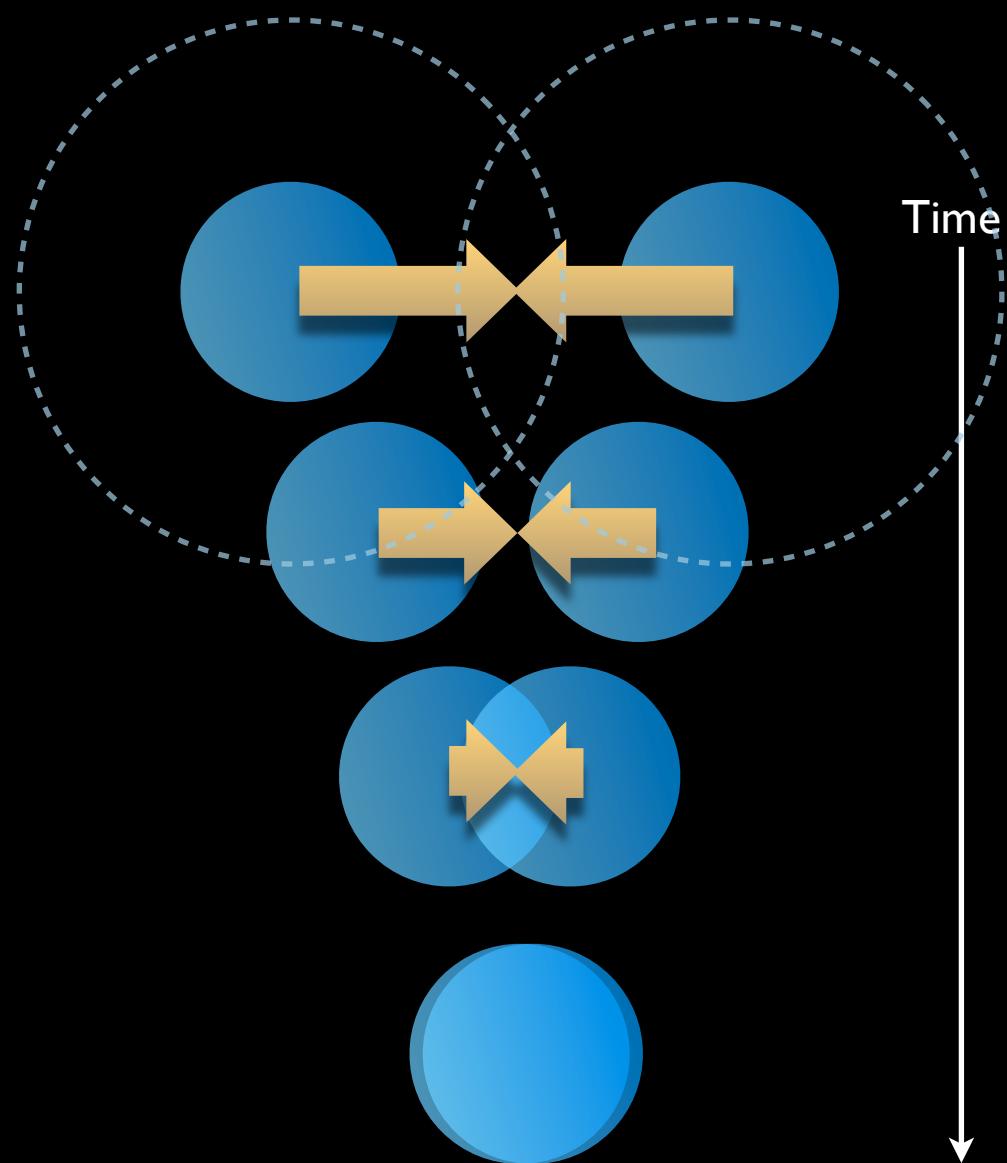
1 step / 1 iteration

# 3 Ingredients

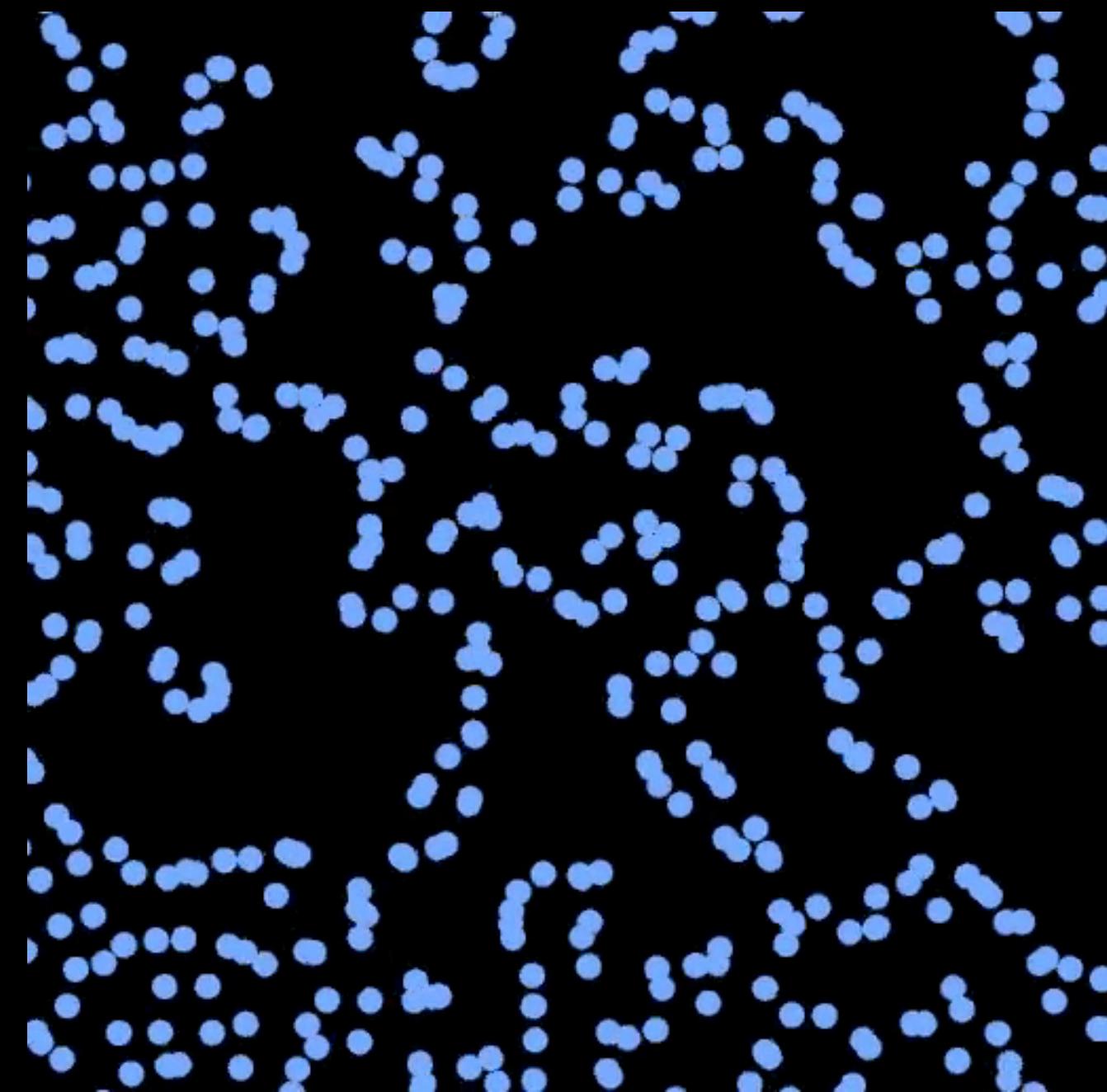
- Density Constraint
- Artificial Pressure
- Implementation

# Tensile Instability

- SPH requires a minimum number of neighbors
- Particles “pull” each other together to try and reach rest density
- Form into clumps

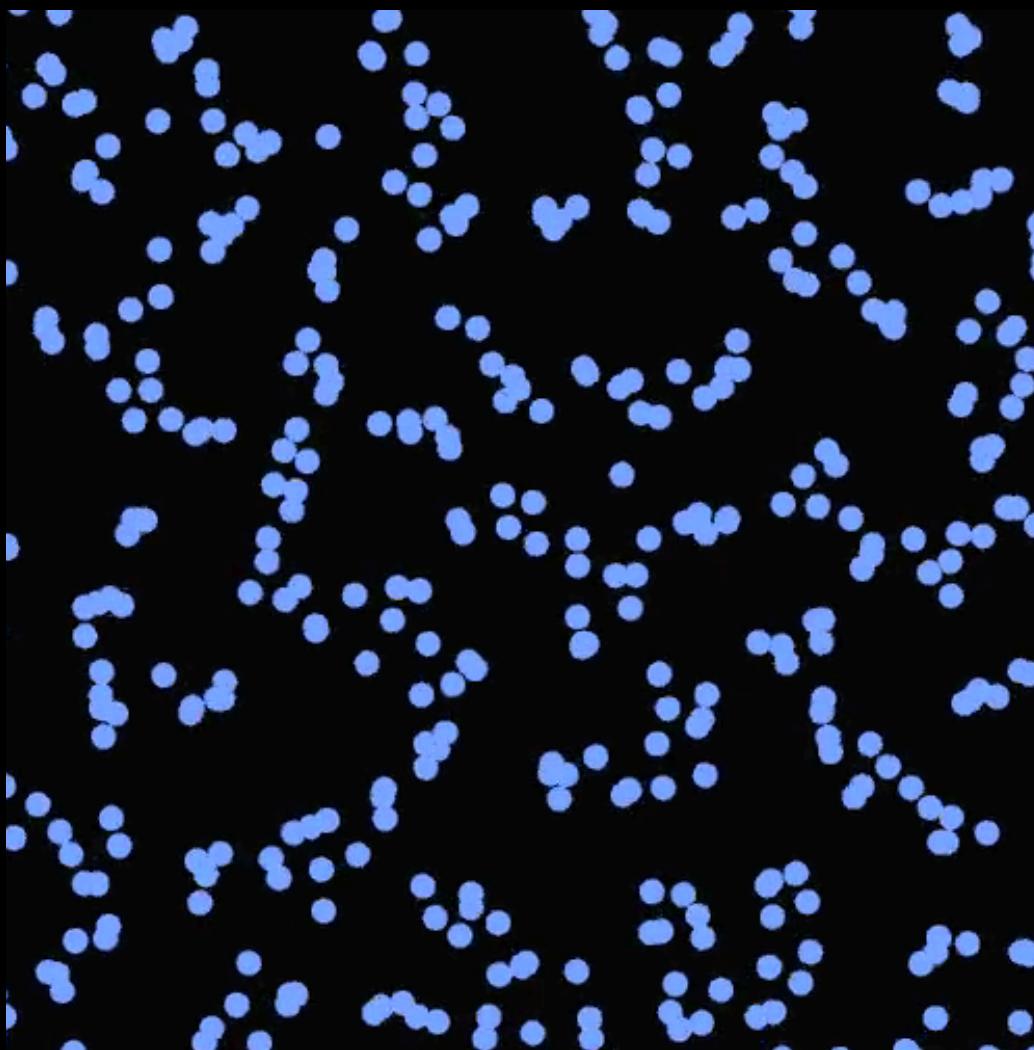


# Without Artificial Pressure



# Possible Solutions to Clumping

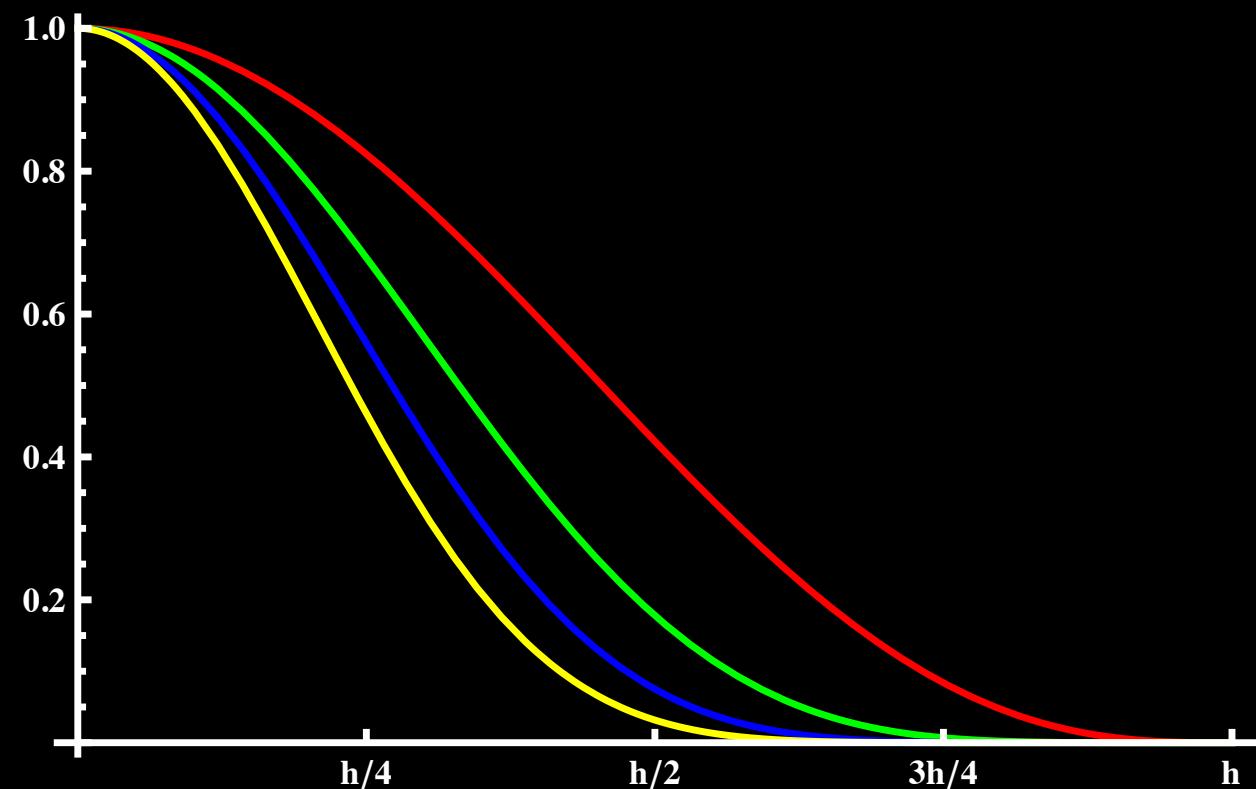
- Clamp constraint function  $\geq 0$
- Use more particles
- Use smaller time-steps
- Use larger smoothing radius

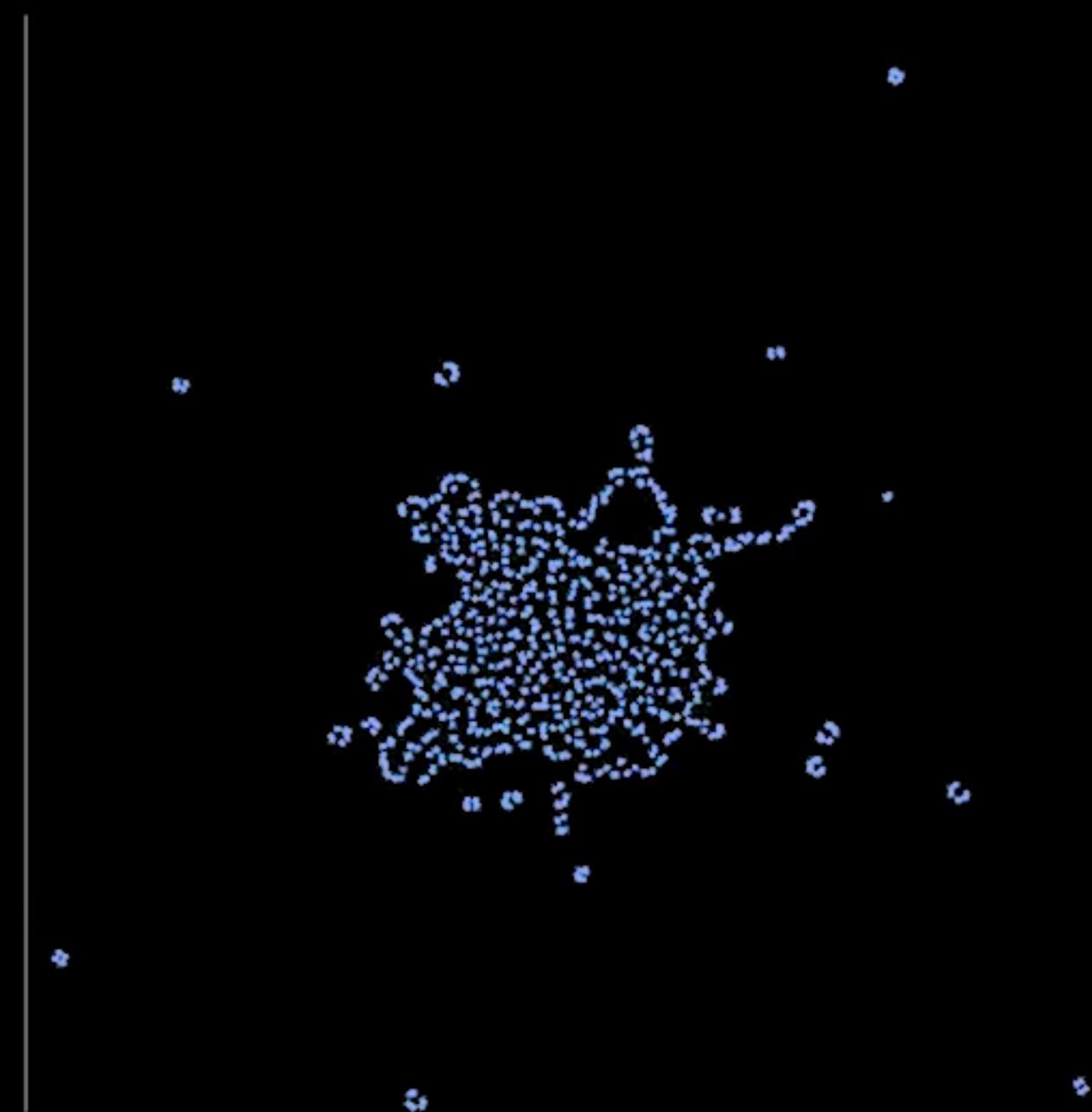


# Artificial Pressure

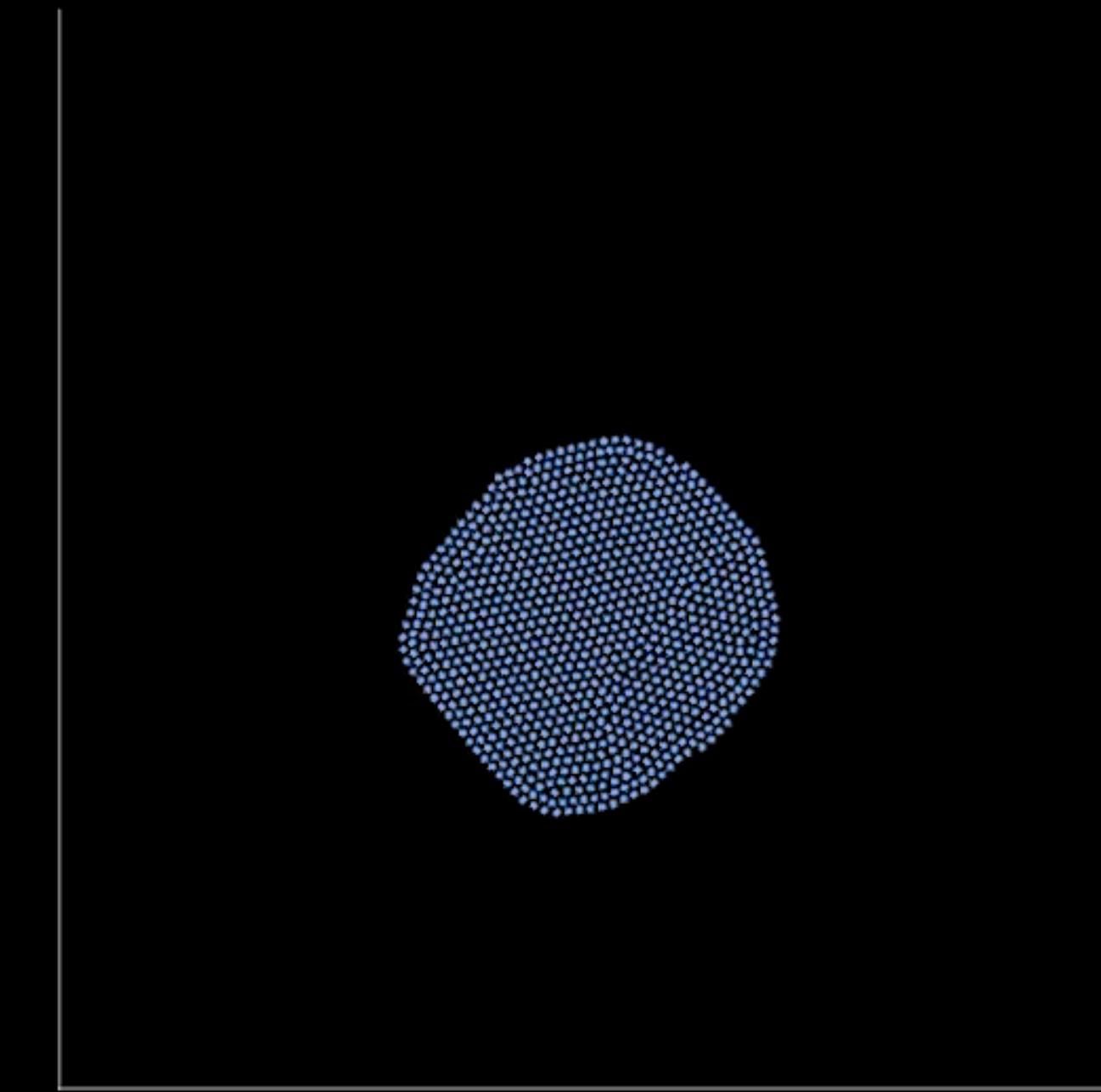
- Inspired by [Monaghan 2000]
- Add a small repulsive term to constraint
- Typical values:  $k = 0.001$   
 $n = 4$   
 $\Delta q = 0$

$$\lambda_{corr} = -k \left( \frac{W(p_i - p_j, h)}{W(\Delta q, h)} \right)^n$$



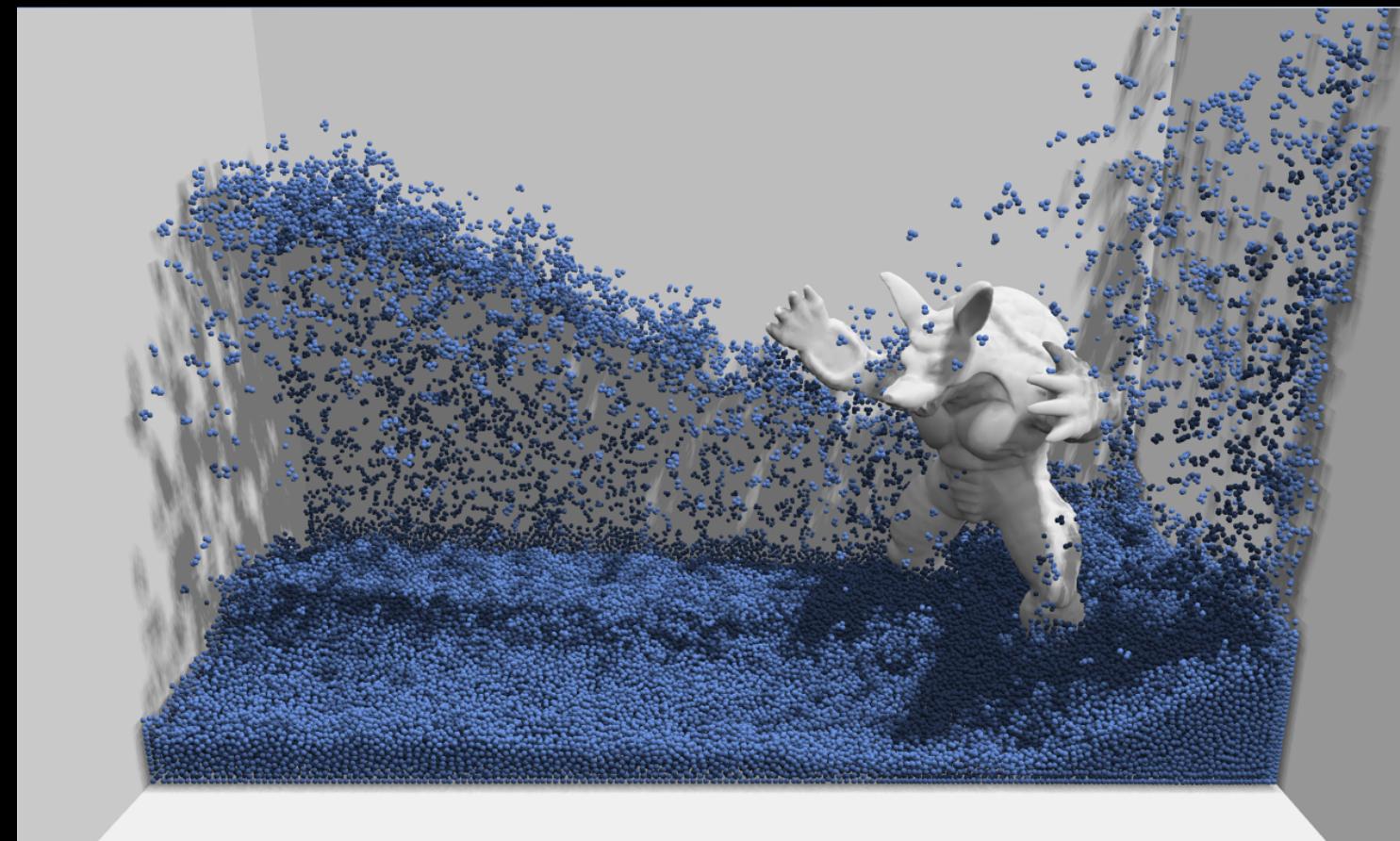


Without Artificial Pressure

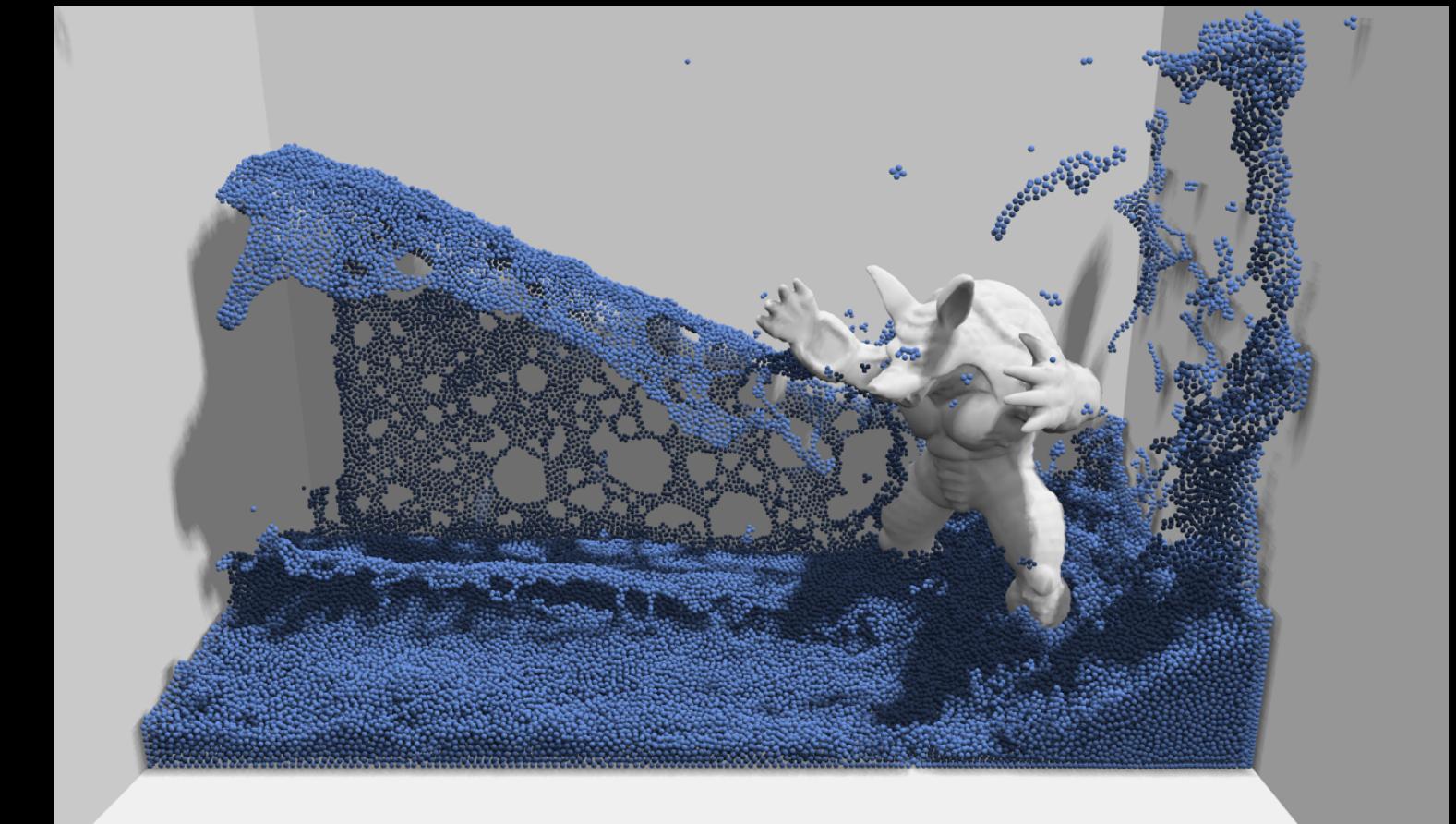


With Artificial Pressure

# Example in 3D



Without Artificial Pressure



With Artificial Pressure

# Artificial Pressure Advantages

- Uniform particle distribution
- Particle cohesion (approximate surface tension)
- Smaller smoothing radius

# 3 Ingredients

- Density Constraint
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# Implementation

- 10 CUDA kernels
- GPU Hash Grid [Green 2008]
- Parallel Jacobi iteration
- 128k particles, 6 iterations, 10ms/frame on GTX680

# Solver Loop

## I. Predict New Positions

$$\mathbf{v}^* = \mathbf{v}^t + \Delta t \mathbf{f}$$

$$\mathbf{p}^* = \mathbf{p}^t + \Delta t \mathbf{v}^*$$

## 2. Find Particle Neighbors

## 3. For $n$ iterations

### a. Calculate Density

### b. Calculate Position Delta (output delta to temp memory)

### c. Update $\mathbf{p}^*$ (apply delta)

### d. Collision Handling (project to surface)

## 4. Update Velocity

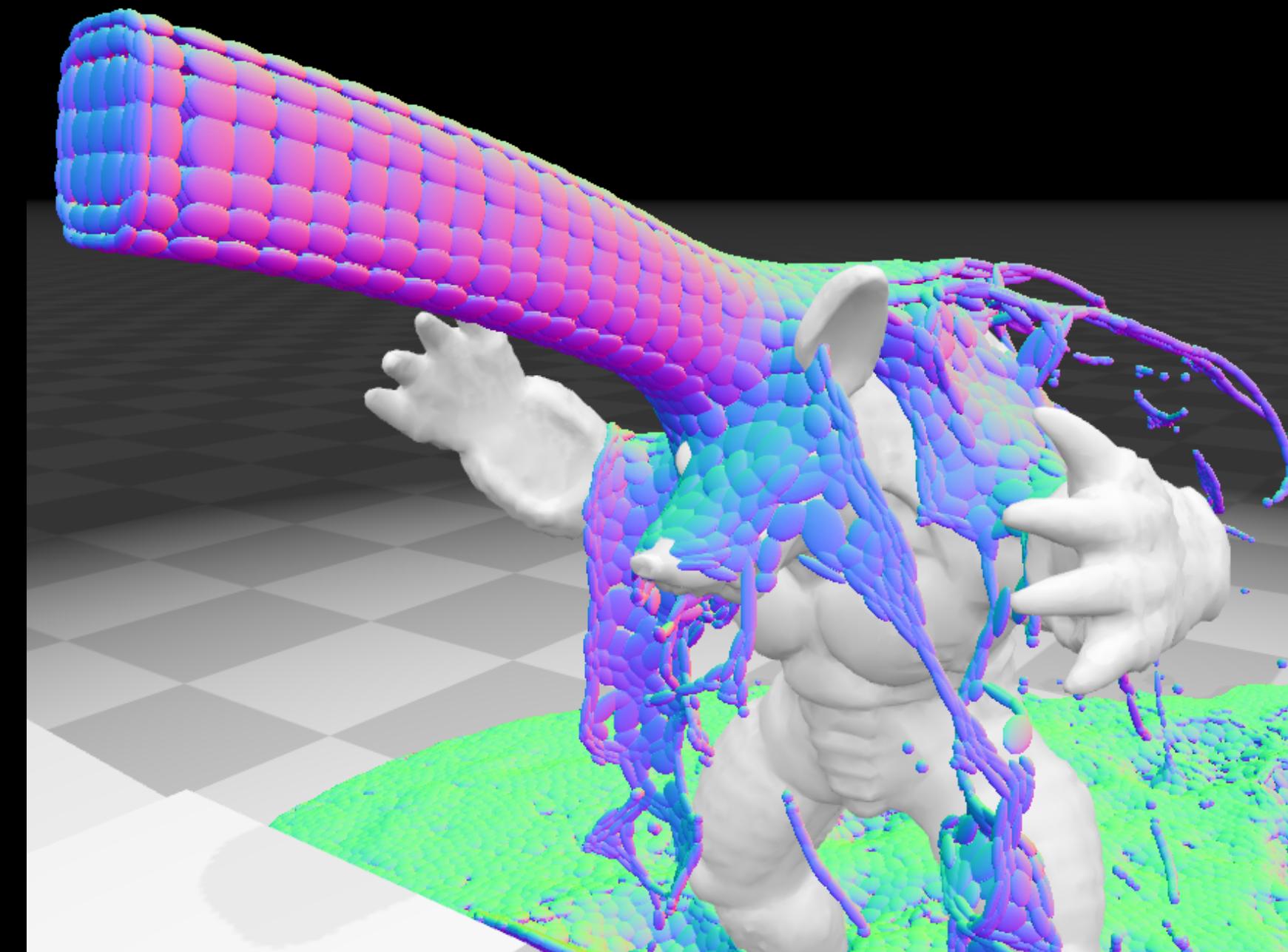
$$\mathbf{v}^{t+1} = \frac{\mathbf{p}^* - \mathbf{p}^t}{\Delta t}$$

$$\mathbf{p}^{t+1} = \mathbf{p}^*$$

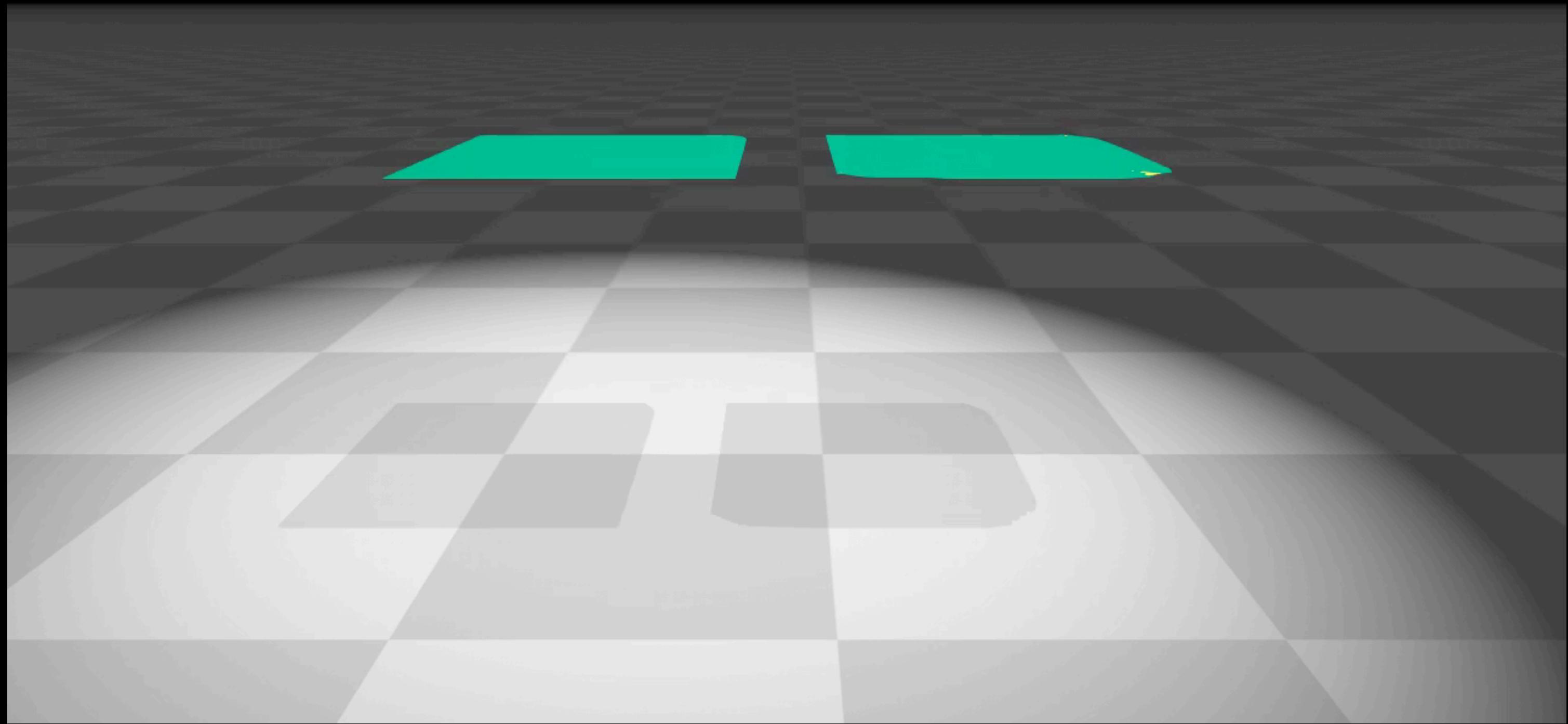
## 5. Apply XSPH Viscosity + Vorticity Confinement

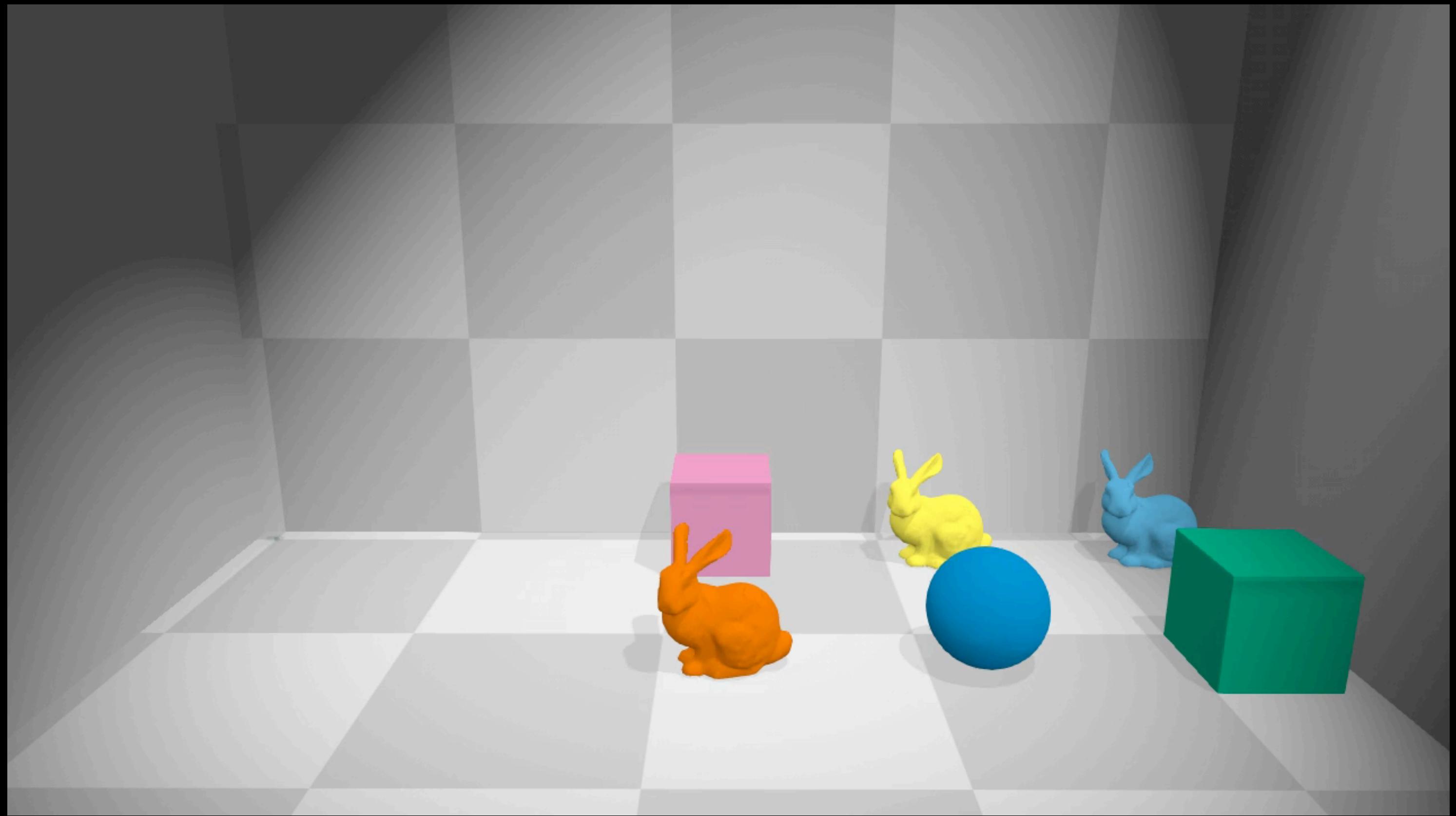
# Rendering

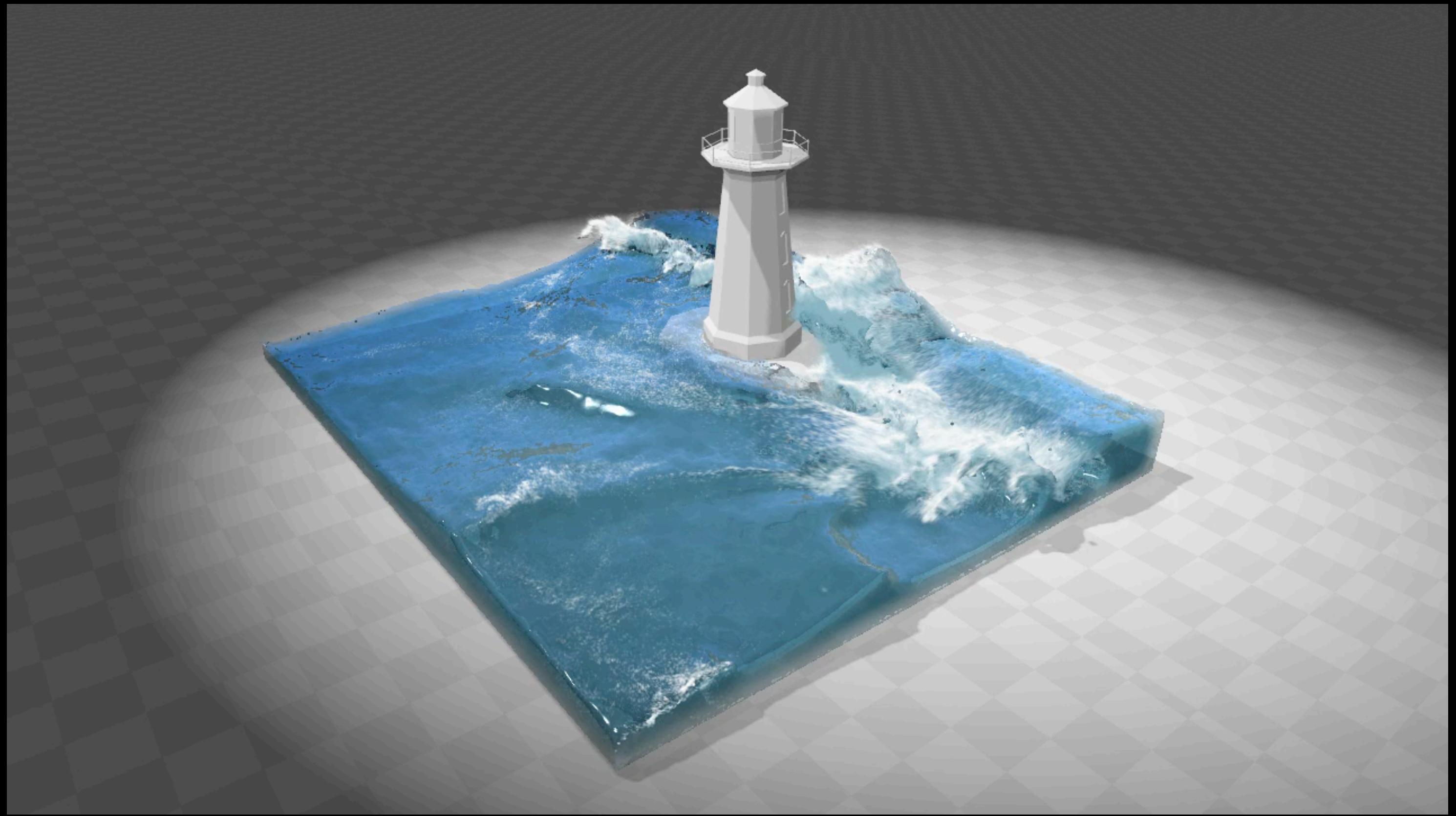
- Anisotropic Particles  
[Yu & Turk 2013]
- Ray-Traced Quadrics  
[Sigg 2006]
- Screen Space Surface Reconstruction  
[van der Laan et al. 2009]



# Recent Results







# Thank You

# Acknowledgments

- Thanks to the PhysX team and paper reviewers
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- [@milesmacklin](https://twitter.com/milesmacklin)

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